Predictive Simulations of Particle-laden Turbulence in a Radiation Environment



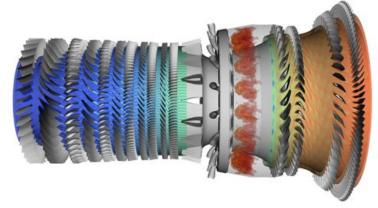
Gianluca laccarino
Mechanical Engineering Department
Stanford University



DOE/NNSA Centers of Excellence at Stanford



1997-2007 ASC Center
Advanced Simulation and Computing



Objective: end-to-end jet engine simulation







DOE/NNSA Centers of Excellence at Stanford

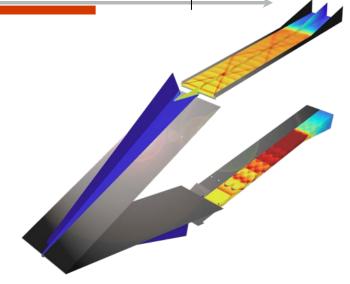
2010

1997-2007 ASC Center Advanced Simulation and Computing

2000

2008-2013 PSAAP Center
Predictive Science Academic Alliance Program

2005



2015

Objective: end-to-end hypersonic scramjet simulation







DOE/NNSA Centers of Excellence at Stanford



1997-2007 ASC Center Advanced Simulation and Computing

2008-2013 PSAAP Center Predictive Science Academic Alliance Program

2013-2018 PSAAP II Center







Stanford PSAAP II



a collaboration between













Stanford University - University of Michigan - Stony Brook University University of Minnesota - University of Colorado - University of Texas



Mission:

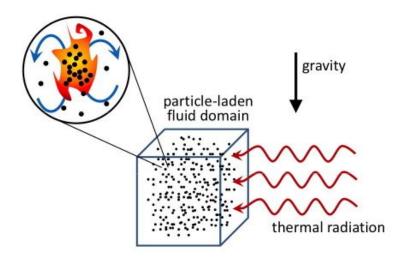
To develop and demonstrate predictive multi-physics simulations of particle-laden turbulence subject to radiation on next-generation exascale compute systems



Mission:

To develop and demonstrate predictive multi-physics simulations of particle-laden turbulence subject to radiation on next-generation exascale compute systems

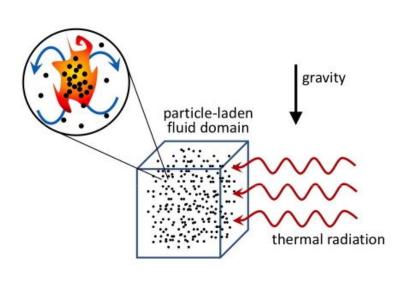
Multiphysics Scenario



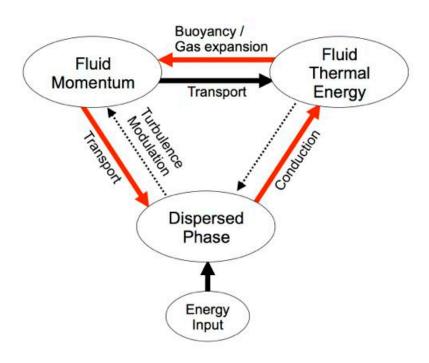
In the absence of external forcing particle-laden turbulence decays... What happens with radiation?



Multiphysics Scenario

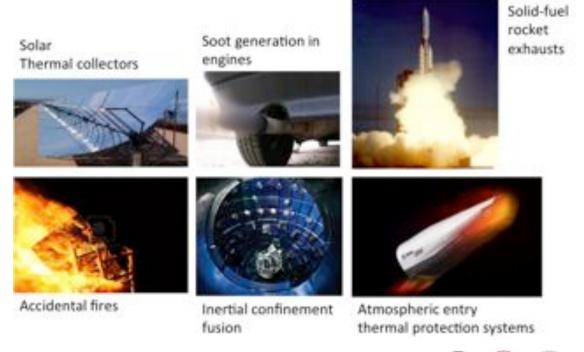


In the absence of external forcing particle-laden turbulence decays... What happens with radiation?



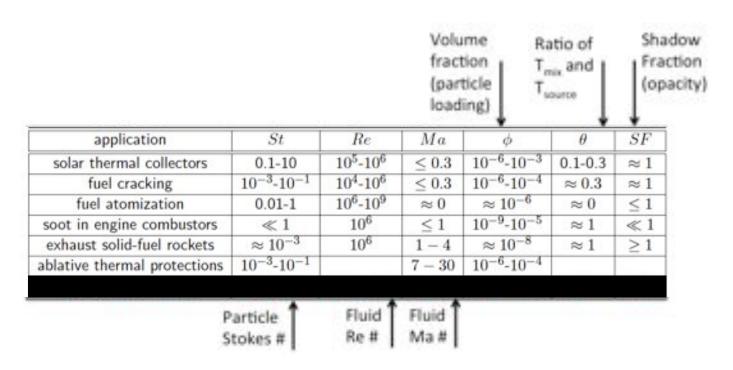


Relevant Applications





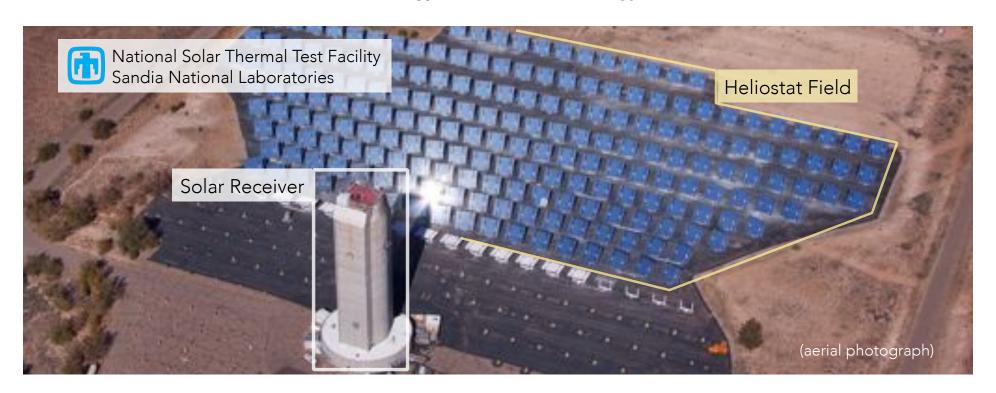
Regime of interest





Solar Thermal Systems

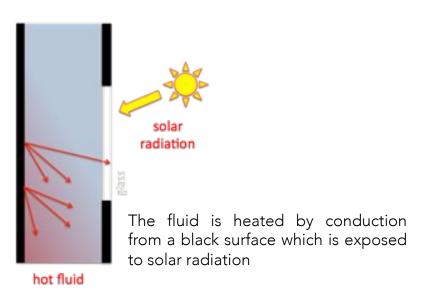
Goal: Harness and convert solar energy into thermal energy



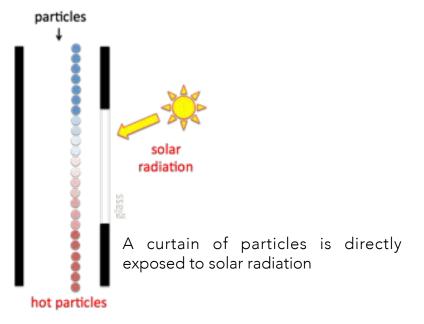
Solar Receivers

Fluid-based Receiver

cold fluid



Particle Receiver

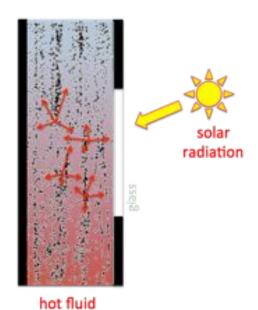




Technological Opportunity

Particle-laden Flow Receiver

cold fluid particles



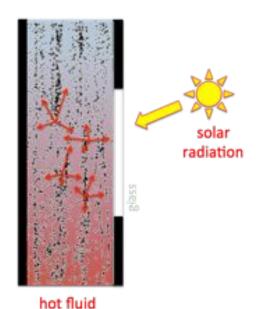
Moving from surface heating to volumetric heating: Particles laden in the fluid absorb solar radiation and through conduction heat the surrounding fluid



Technological Opportunity

Particle-laden Flow Receiver

cold fluid particles



Moving from surface heating to volumetric heating: Particles laden in the fluid absorb solar radiation and through conduction heat the surrounding fluid

Questions:

Is this system more efficient?
Can it be scaled for higher energy production?
Can the particle size be adjusted to reduce the impact of solar radiation variability?



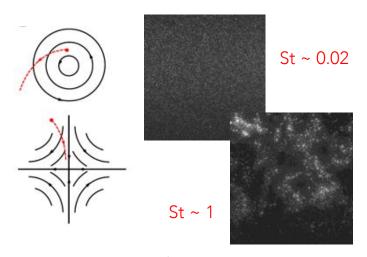
Scientific Challenge

Multi-physics coupling of: turbulence, radiation, and particle transport

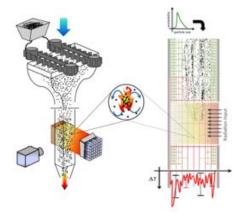


Scientific Challenge

Multi-physics coupling of: turbulence, radiation, and particle transport Starting point is particle-laden turbulence



Clustering (preferential concentration) in particle-laden turbulence - J. Eaton

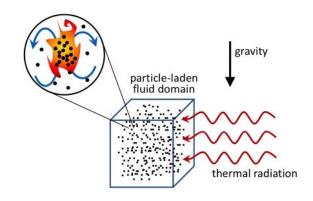


Leverage experimental facilities to fully validate the simulations



Preliminary Computations

Can radiation generate and sustain turbulence in a particle-laden fluid?



Preliminary calculations carried out while writing the proposal!!!!



The "Simplified" Mathematical Model

CONTINUITY

$$\frac{\partial \rho}{\partial t} + \frac{\partial}{\partial x_i}(\rho u_i) = 0$$

MOMENTUM EUQATION
$$\frac{\partial}{\partial t}(\rho u_i) + \frac{\partial}{\partial x_j}(\rho u_i u_j) = -\frac{\partial p}{\partial x_i} + \frac{1}{\text{Re}} \frac{\partial \tau_{ij}}{\partial x_j} - \frac{\kappa}{N_p} \mathcal{P}(\frac{\mathcal{I}(u_i) - v_i}{\text{St}})$$

$$\text{FNERGY FOUATION}$$

ENERGY EQUATION

ENERGY EQUATION
$$\frac{1}{\gamma} \frac{\partial}{\partial t} (\rho T) + \frac{\partial}{\partial x_j} (\rho T u_j) = \frac{1}{\text{Re Pr}} \frac{\partial}{\partial x_j} (\frac{\partial T}{\partial x_j}) - \frac{2}{3} \frac{\kappa}{\text{Pr StN}_p} \mathcal{P}(\mathcal{I}(T_g) - T_p)$$

$$LAGRANGIAN PARTICLE FOUNTIONS$$

$$Re = \frac{u_{ref} L_{ref} \rho_{ref}}{\mu}$$

$$St = \frac{\tau_p u_{ref}}{L_{ref}} \qquad \tau_p = \frac{\rho_p d_p^2}{18\mu}$$

Dimensionless numbers

$$\gamma = \frac{C_F}{C_V}$$

$$\Gamma = \frac{C_V}{C_V}$$

$$Pr = \frac{C_{Pl}}{k}$$

$$Re = \frac{u_{ref}L_{ref}\rho_{ref}}{u}$$

$$\mathbf{St} = \frac{\tau_p u_{ref}}{L_{ref}} \qquad \qquad \tau_p = \frac{\rho_p \sigma_p}{18}$$

$$\kappa = \frac{N_p m_p}{L_{ref}^3 \rho_{ref}}$$

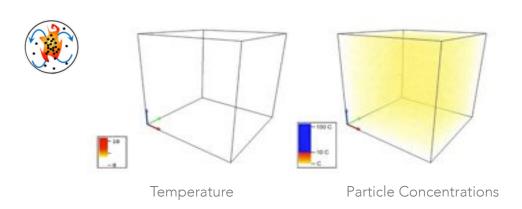
$$\tilde{\alpha} = \frac{\alpha N_p}{C_P L_{ref}^2 \rho_{ref} T_{ref} u_{ref}}$$

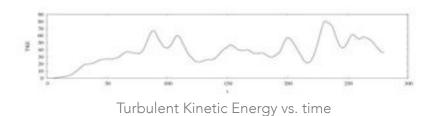
No buoyant forces - Lagrangian point particles (no interactions) -Uniform radiation (Optically thin)



Preliminary Results

Effect of radiation on particle-laden free turbulence





Small particle St #:

Absorbed radiation induces small temperature gradients and only weak turbulence

- R. Zamanski, H. Poraunsari & A. Mani

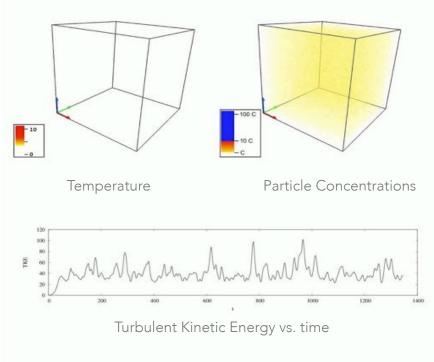
St = 0.018



Preliminary Results

Effect of radiation on particle-laden free turbulence





Large particles St #:

Absorbed radiation induces strong temperature gradients and particle clustering

- R. Zamanski, H. Poraunsari & A. Mani

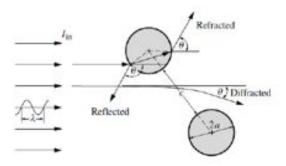
$$St = 0.35$$



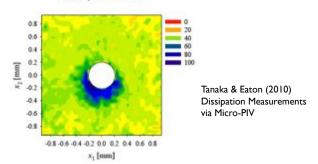
Research Agenda, 1

Single-Physics Modeling

- Investigate radiation models
 - o (in)homogeneous absorption
 - discrete ordinates
 - o ray tracing
- Beyond point-particle tracking
 - o finite-size effects
 - o wall interactions, collisions





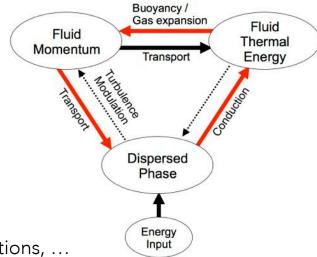




Research Agenda, 2

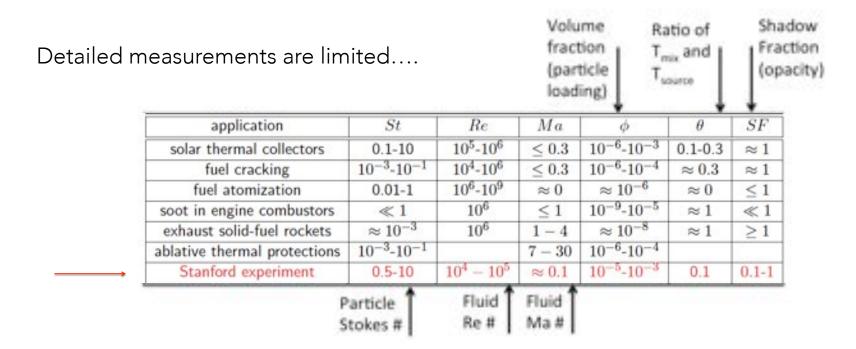
Coupling effects

- Radiation absorption by particles
 - o Emissivity, surface properties
 - o secondary absorption
- Heat transfer between particles & fluid
- o non-equilibrium
- o non-locality
- Turbulence
 - o Modulaton by particles: dissipation in wakes, ...
 - \circ $\,$ Radiation interactions with temperature/density fluctuations, \dots
- Three-way interactions





Regime of interest





Validation Experiment

Eaton vertical tunnel @ Stanford

• Re: 10K - 100K

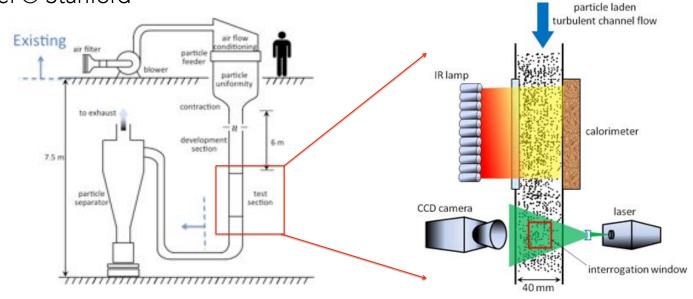
• MLR: 0 - 50%

• Stokes #: 0.5 - 5

Rad: 0 - 230kW/m²

• ΔT_{max} : up to 300K







Uncertainty Quantification

Many sources of uncertainties

Naturally occurring

- Particle size/property variability
- Radiation forcing
- Losses through walls
- Inflow/Injection conditions

. . .

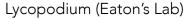
Mathematical models

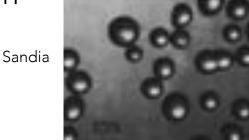
- Particle physics
- Radiation/particle coupling
- Airflow/particle interactions

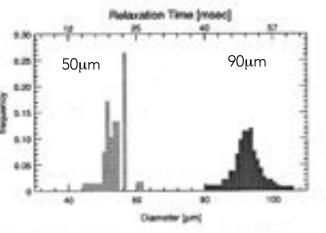
• ...













Uncertainty Quantification

Leverage PSAAP UQLab

Algortihms for Aleatory UQ

- Stochastic expansion methods: beyond polynomials, e.g. Pade', wavelets
- Compressed sensing based sampling
- Key new elements: from random variables to random fields

Methodologies for Epistemic UQ

- Turbulence
- Key new element: model-form uncertainty influences the coupling



Uncertainty Quantification

Leverage PSAAP UQLab

Algortihms for Aleatory UQ

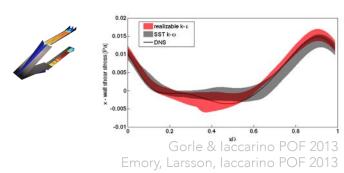
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Methodologies for Epistemic UQ

- Turbulence
- Key new element: model-form uncertainty influences the coupling

Turbulence EUQ Approach

- Intrusive
- Non-probabilistic (no sampling) and accounts for model bias
- Includes physical constraints
- Provides insights into modeling errors
- Can be combined to "standard" aleatory UQ approaches with proper accounting





UQ Research Plan

Turbulence

M1/M3 – Short term

Extend PSAAP/EUQ approach (EUQ)

M3/M5 – Long term

 Develop intrusive stochastic subgrid velocity models (EUQ)

Particle Transport

M1-M3 – Short term

- Probabilistic particle size distribution
- Use SG/SC models (AUQ)

M2-M5 – Long term

- Increase # of uncertainties, e.g. particle shape, emissivity, etc. (AUQ)
- Spatially varying properties/random field model using physical constraints (EUQ)
- Incorporate stochastic subgrid velocity models (EUQ)

Radiation

M1 – Short term

• Probabilistic absorption coefficient

M2/M4 – Medium term

- Absorption coefficient as a random field
- Stochastic representation using KL or wavelet expansions
- Non-uniform input source

M3/M5 – Long term

Stochastic discrete ordinance methods

Coupling

- Represent model-form EUQ of the interactions
- Keep track of the source for measuring relative importance





Mission:

To develop and demonstrate predictive multi-physics simulations of particle-laden turbulence subject to radiation on next-generation exascale compute systems

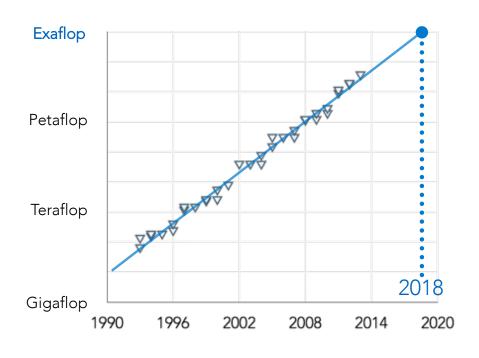


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The road to exascale

How to exploit next-generation computational resources?



Complexity deriving from:

- Memory Hierarchies
- On-Chip vs In-Cabinet vs Across-System Communications
- Custom Non-conventional Networks
- Massive data management & mining
- Resiliency
- ...

Software Abstractions

- CPU/GPU: C++, CUDA, OpenCL
- Queues for scheduling work between CPU/GPU?
- Nodes: Threads and locks pthreads, OpenMP,...
- Cluster: Message passing MPI
- ...



The road to exascale

From Teraflop to Petaflop to Exaflop

I To E

The road to exascale



The road to exascale...

Top systems display remarkable diversity

	NAME	SPECS	SITE	COUNTRY	CORES	R _{MAX} PROFES	POWER
1	Tianhe-2 (Milkyway-2)	NUDT, Intel by Bridge (12C, 2.2 GHz) & Xeon Phi (57C, 1.1 GHz), Custom interconnect	NUDT	China	3,120,000	33.9	17.8
2	Titan	Cray XK7, Opteron 6274 (16C, 2.2 GHz) + Nvidia Kepler (14C, .732 GHz), Custom interconnect	DOE/SC/ORNL	USA	560,640	17.6	8.3
3	Sequoia	IBM BlueGene/Q, Power BQC (16C, 1.60 GHz), Custom interconnect	DOE/NNSA/LLNL	USA	1,572,864	17.2	7.9
4	K computer	Fujitsu SPARC64 VIIIfx (BC, 2.0GHz), Custom interconnect	RIKEN AICS	Japan	705,024	10.5	12.7
5	Mira	IBM BlueGene/Q, Power BQC (16C, 1.60 GHz), Custom interconnect	DOE/SC/ANL	USA	786,432	8.16	3.95

CPU Architecture

Accelerators











BlueGene/Q

Cray XK7

Nvidia TESLA GPU

Intel Phi

What's next?



The road to exascale...

Not just performance...

Our multiphysics problem naturally involves diverse computational strategies

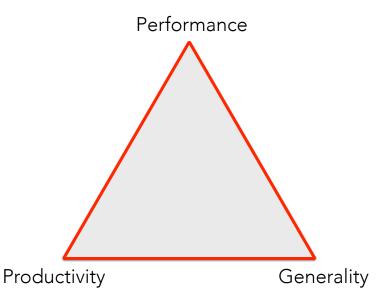
- PDE solvers (flow)
- Lagrangian tracking (particles)
- Integro-differential equation (radiation)

and several options

- Eulerian transport for particles
- Ray tracing for radiation
-

Key ingredients:

- Interoperable Domain Specific Languages
- Resiliency Libraries
- Legion Automatic Memory Mapping/Management





The road to exascale...

Not just performance...

Our multiphysics problem naturally involves diverse computational strategies

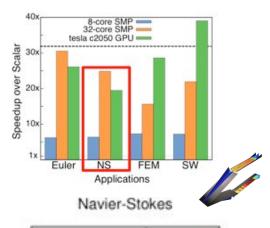
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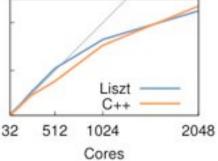
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Software development

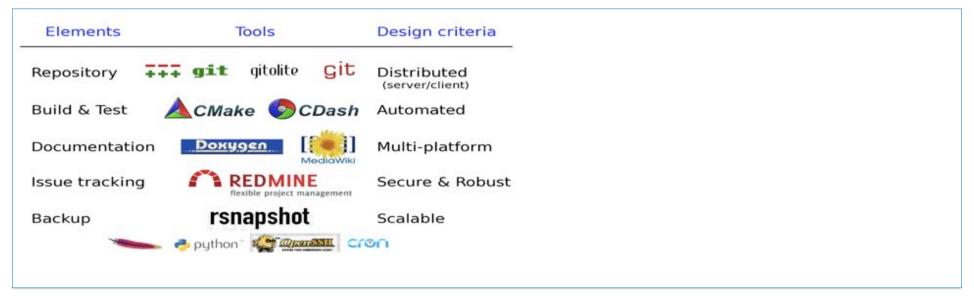
Where we are (framework from PSAAP):

- Objectives (Why):
 - -Ensure Quality of software through V&V (unit/system/regression testing)
 - -Ease and enhance experience of:
 - Developers: enable & promote <u>collaboration</u> (modularity + automation)
 - Users: seamless cross-platform installation & execution
- **Drivers** (conceptual *How*):
 - -Apply principles of Continuous Integration
 - -Incorporate best-practices from Open-Source community
- Implementation (practical How): combine git, gitolite, cgit, CMake, CDash, Redmine, rsnapshot, cron, MediaWiki, Doxygen, ...

Framework encapsulates code through weak coupling



Software development

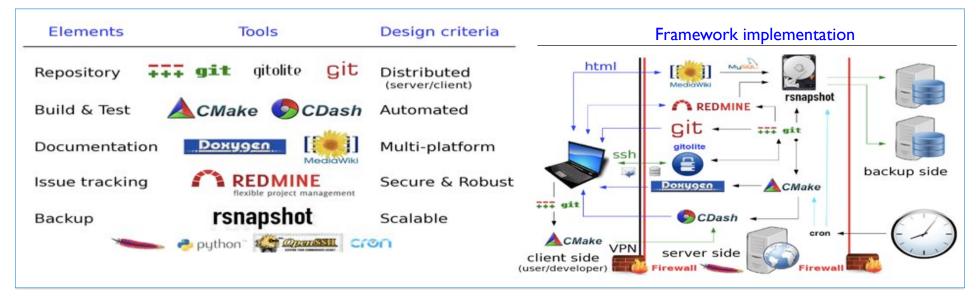


• Implementation (practical *How*): combine git, gitolite, cgit, CMake, CDash, Redmine, rsnapshot, cron, MediaWiki, Doxygen, ...

Framework encapsulates code through weak coupling



Software development



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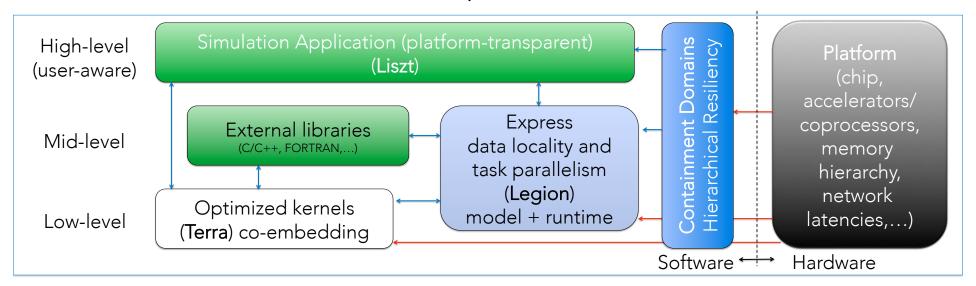
Framework encapsulates code through weak coupling



Software development – in PSAAPII

- Objectives (Why):
 - -develop programming model & framework that
 - -enable V&V+R(eliable) scientific simulations at exa scale and
 - -ensure transparency and accessibility for non-experts in HPC
- Drivers (conceptual How):
 - -Bridge Computational & Computer Science (models & algorithms/systems)
 - -Integrate:
 - High-level, natural application-targeted programming
 - Mid/low-level platform-aware parallelism models and runtime systems
- Implementation (practical How):
 - -Write application in Liszt domain-specific language (high-level abstraction)
 - -Express logical-region locality and task parallelism in Legion (mid/low-level)
 - -Co-embed in **Terra** to exploit high-performance optimization (*low-level*)
 - -Interface Containment Domains for hierarchical fault-tolerance/resiliency

Software development – in PSAAPII



- Implementation (practical How):
 - -Write application in Liszt domain-specific language (high-level abstraction)
 - -Express logical-region locality and task parallelism in Legion (mid/low-level)
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Project organization and research team...

PSAAP II Research Team





Boyd









Aiken

Alonso

Darve

Eaton

Hanrahan

laccarino

Lele

Mani

Moin

Papanicolaou

Glimm Mahesh Doostan Erez



PSAAP II Research Team





Boyd

Physics

(radiation)









CS Aiken **CS/Physics** Alonso CS Darve **Physics** Eaton Hanrahan **CS/Physics UQ/Physics** laccarino **Physics** Lele **Physics** Mani Moin **Physics**

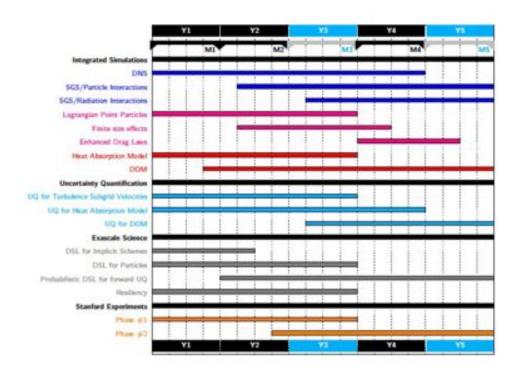
UQ/Physics Papanicolaou

Glimm Ma UQ Phy

Mahesh Physics (particles) Doostan UQ Erez CS (resiliency)



PSAAP II Project Plan



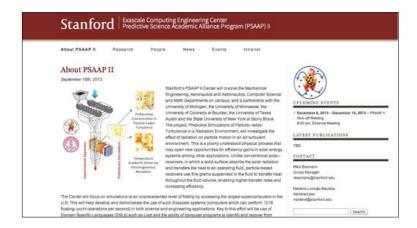
- M1 Predictive simulations of low-Reynolds number turbulence with low mass loading under a moderate radiation input. Radiation is modeled using a lumped heat absorption model. Direct comparisons to Stanford's experiments will be carried out. Uncertainties account for the effect of imprecision in the specification of the boundary conditions and the parameters used in the absorption model. The current PSAAP codes, enhanced with Lagrangian tracking and the radiation model will be used.
- M2 The objective in Year 2 is to increase the scope of the M1-type simulations by considering a more realistic uncertainty model for the absorption coefficient used in the radiation transport; a random field model will be considered. This will naturally require an increased number of computations; to enable these investigations, a DSL-enhanced version of the code will be deployed.
- M3 In Year 3, the computational tools developed in the previous years will be exercised within a comprehensive UQ study. The objective is to investigate the effect of uncertainties in both the radiation source uniformity and particle size. In addition, the effect of the model uncertainty in the absorption model will be characterized and the resulting mixing efficiency variability will be characterized in detail. In this context the problem requires multiple M2-type simulations, further increasing the overall computational complexity.
- M4 The objective in Year 4 is to perform simulations in a range of controlling parameters different from that considered in M1. Increases in the Reynolds number, the particle loading and a more realistic representation of finite-size effects in the particle transport will be considered. The use of resiliency libraries will be demonstrated.
- M5 The goal in Year 5 is to revisit the UQ assessment carried out in Year 3 in the regime corresponding to the M4-type simulations. In addition to all the previous uncertainties, we will also consider additional sources related to the properties of the particles, for example emissivity imperfections. This will considerably enhance the computational complexity because of the increased dimensionality in the representation of the uncertainty. We anticipate to leverage the development in a probabilistic DSL to enable these final simulations.



- Organization & Management
 - Administrative & financial structure in place
 - Website and intranet launched (90% complete)
- Introductory Town Hall Seminars (4 held)
 - Background information
 - Review of the state of the art
- Research meetings (weekly)
 - Discussion of proposed activities and challenges
 - Task Planning
- Research activities
 - design of the P-code
 - (very) preliminary computations
- Personnel
 - Senior research associates (1 down, 1 to go)
 - First group of PhD students (4 out of 6 are US citizens)



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Prof. Ali Mani

"Interactions of particle transport, turbulence and radiation, what do we know?" 9/20/2013

Prof. John Eaton

"Preferential concentration in particle-laden turbulence" 9/27/2013

Prof. lain Boyd (Michigan)

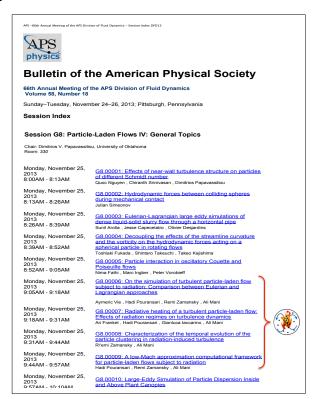
"Modeling radiat Prof. Pat Hanrahan "DSL and Legion



youtube channel



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In conclusion

Many scientific challanges...

- Physics: three-way coupling of turbulence/particles/radiation is largely unexplored; is there a self-sustaining cycle? Is the interaction robust across difference regimes?
- SQA: each physics components has a favorite numerical method; how to combine in a single, efficient and verifiable framework?
- Exascale: DSLs have been demonstrated for single-physics problems; can we combine multiple, interoperable DSLs and manage data efficiently and reliably on hybrid architectures?
- UQ: aleatory and epistemic uncertainties are abundant and of different origin: can we embed UQ techniques in the software infrastructure? Can we use advances in stochastic sensing techniques to speed up the UQ assessment?
- Validation: modern and detailed measurements are scarce; can we design a controlled apparatus with large parameter variation to validate our tools?



Stanford PSAAP II

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